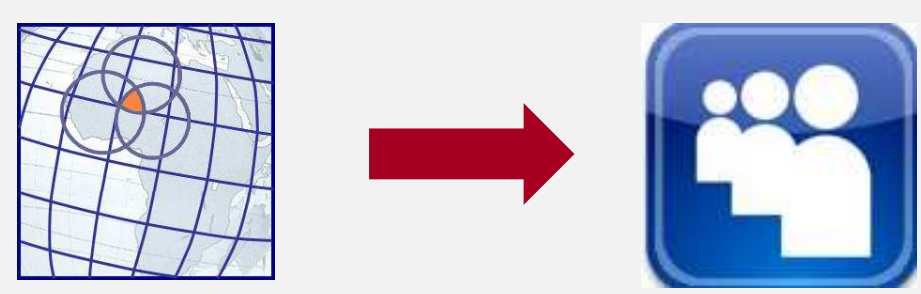


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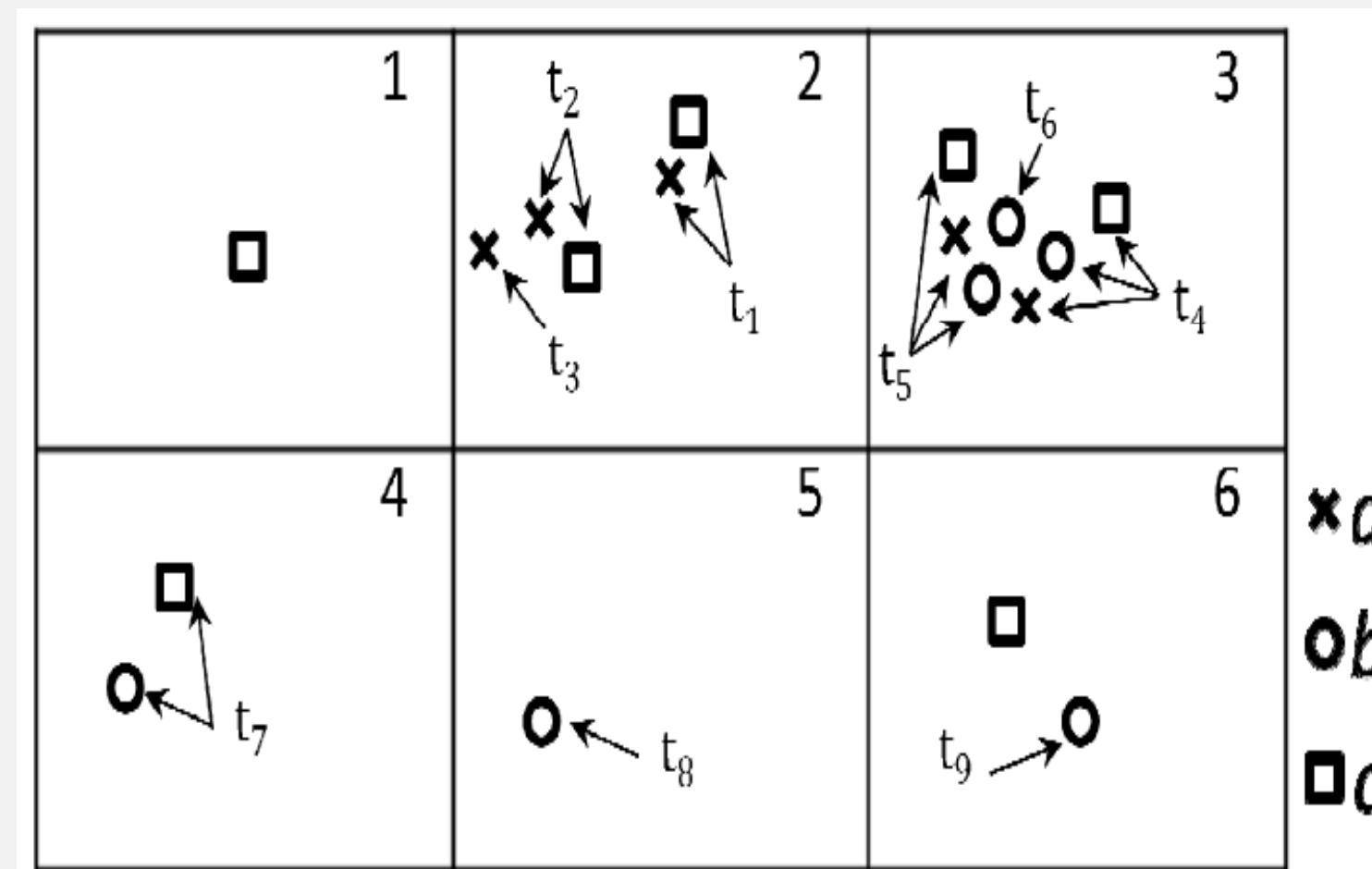
## MOTIVATION



- With the popularity of GPS-embedded devices, a large amount of spatiotemporal data can be easily collected or is already available.
- Spatiotemporal data capture people's visit patterns, and the information hidden behind those data is a strong indicator of social connections.
- Necessity to seek alternative methods to infer social relationships from people's behaviors in the physical world.

## PROBLEM DEFINITION

Given a set of users  $U$ , a set of places  $P$ , and triplets of social events specifying *who visited where and when*

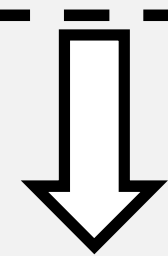


How to infer **social connections** among people and how to **measure the social distances** quantitatively?

## GEOSO MODEL

### Data Representation

Input: who visited where and when  
 $\langle \text{user}, \text{location}, \text{time} \rangle$



<b>Visit vectors</b>	$V_a = (0, \langle t_1, t_2, t_3 \rangle, \langle t_4, t_5 \rangle, 0, 0, 0)$ $V_b = (0, 0, \langle t_4, t_5, t_6 \rangle, t_7, t_8, t_9)$
<b>Co-occurrence vectors</b>	$C_{ij} = (c_{i1,j1}, c_{i2,j2}, \dots, c_{iN,jN})$
<b>Master vector</b>	$M = (m_1, m_2, \dots, m_k, \dots, m_N)$ $m_k = \max_{1 \leq i < j \leq U, 1 \leq k \leq N} c_{ik,jk}$

### GEOSO Distance Measure

$$d_{ij} = \sqrt{\sum_k (c_{ik,jk} - m_k)^2}, \quad s_{ij} = \frac{1}{d_{ij}}$$

Social Distance =

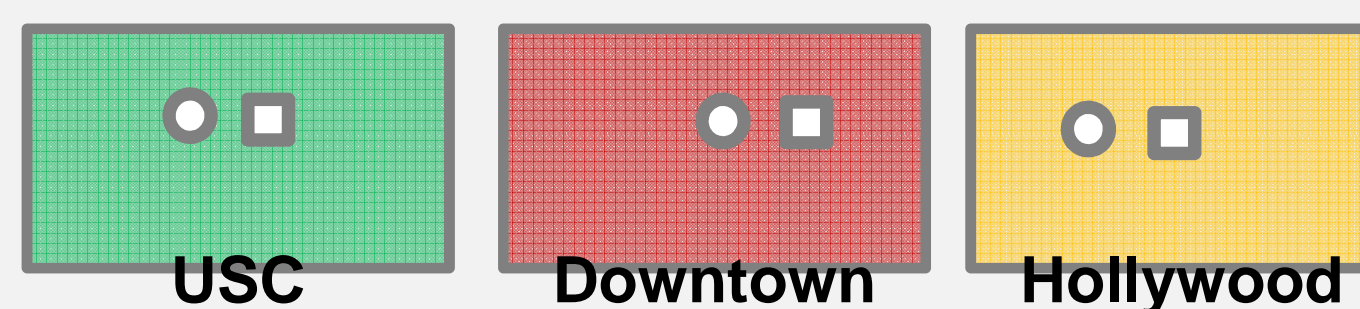
Euclidian distance from co-occurrence vector to the master vector.

Social Similarity =

Inverse of social distance.

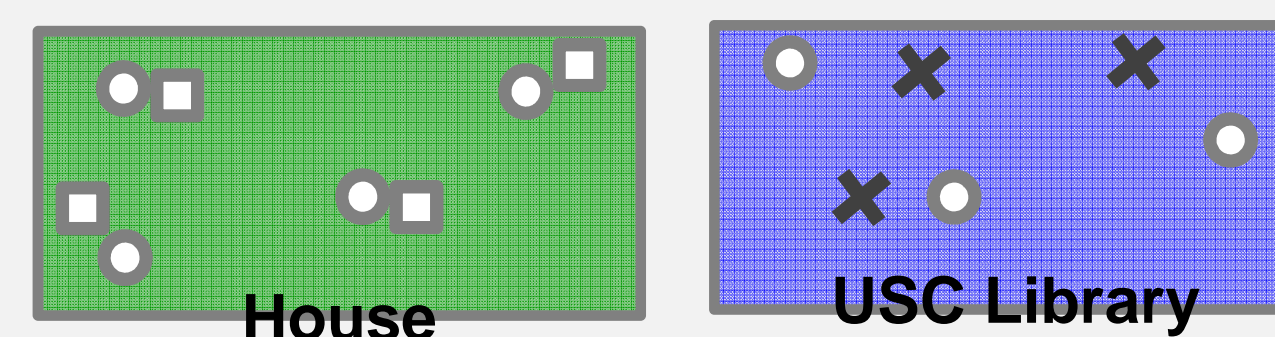
### Properties

Compatibility



Two users are highly compatible

Commitment



Two users have high commitment

## COMPATIBILITY V.S. COMMITMENT

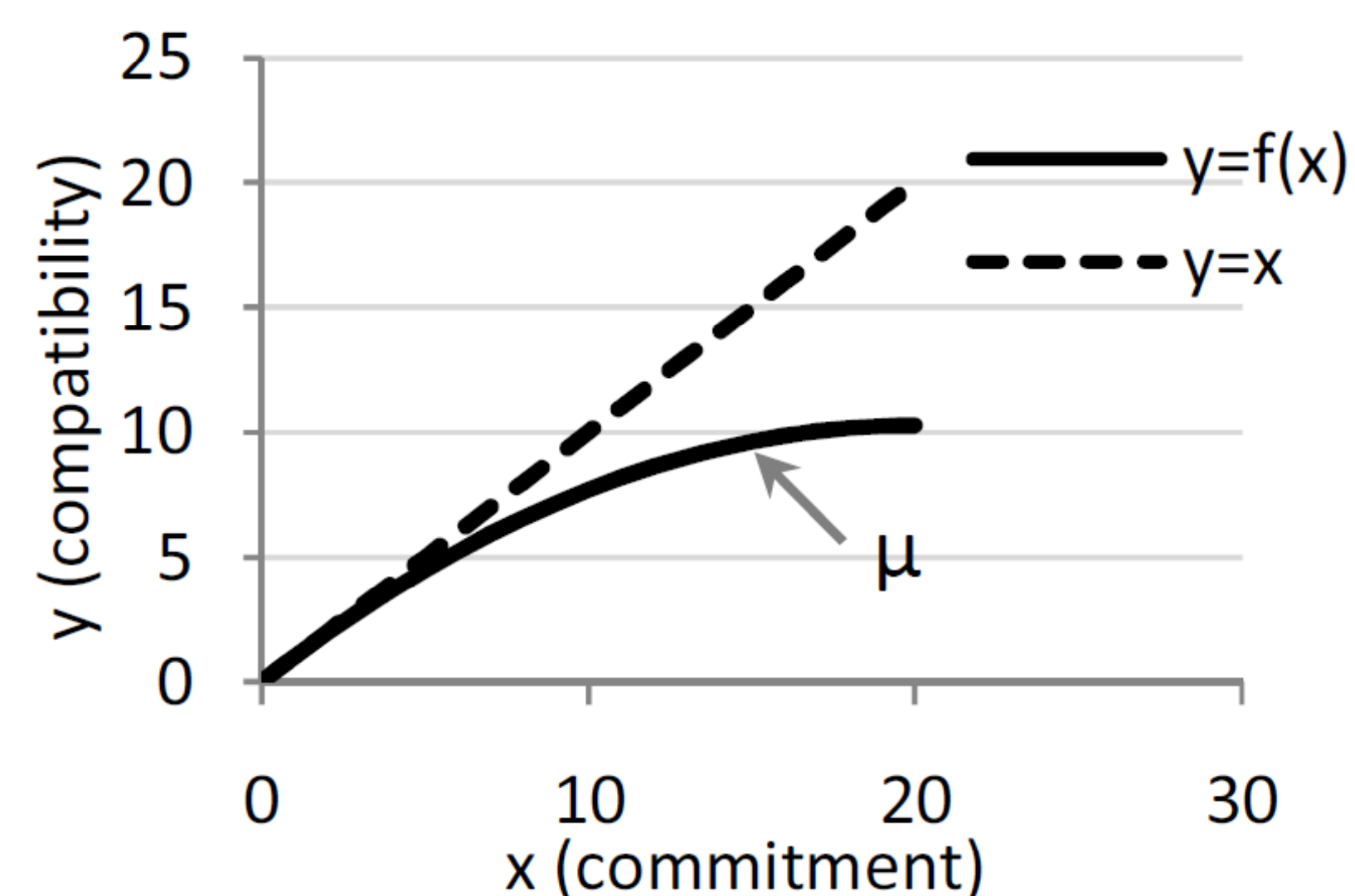
### Intuitions

1. Compatibility has more impact on social distance than commitment
2. High commitment might be an indicator of coincidences

### Observations

1. As the graph is located below the line  $y=x$ , compatibility calculated by GEOSO indeed has more impact on social distance than commitment.
2. As compatibility grows commitment also grows, but with a higher speed to catch up the same amount of social distance.
3. The contribution to social distance of commitment gets saturated at  $\mu$ , which limits/avoids coincidences in case of high commitment.

$$y = f(x) = \frac{2mx - x^2}{2m - 1}$$



Graph of compatibility vs. commitment under the condition that they both yield the same amount of social distance.

